



Algorithm Design Techniques



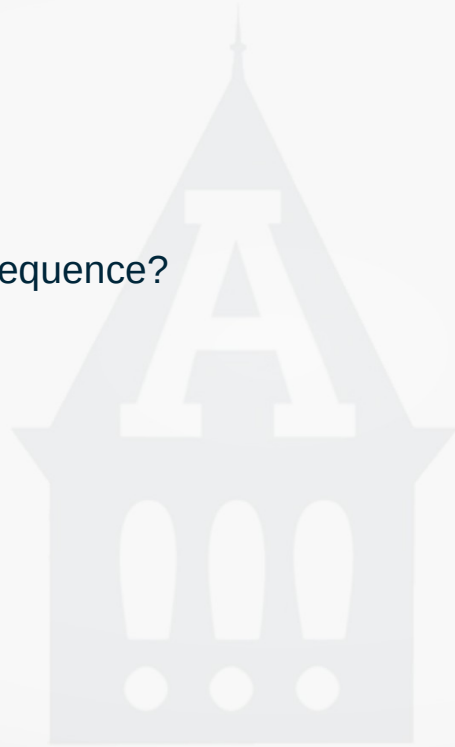
Greedy Algorithms
Dynamic Programming

Longest Common Subsequence

- The Longest Common Subsequence (LCS) is as follows...
- We are given two strings, S of length n and T of length m
- Produce their longest common subsequence
- The longest subsequence of characters that appear left-to-right, but not necessarily in a contiguous block, in both strings

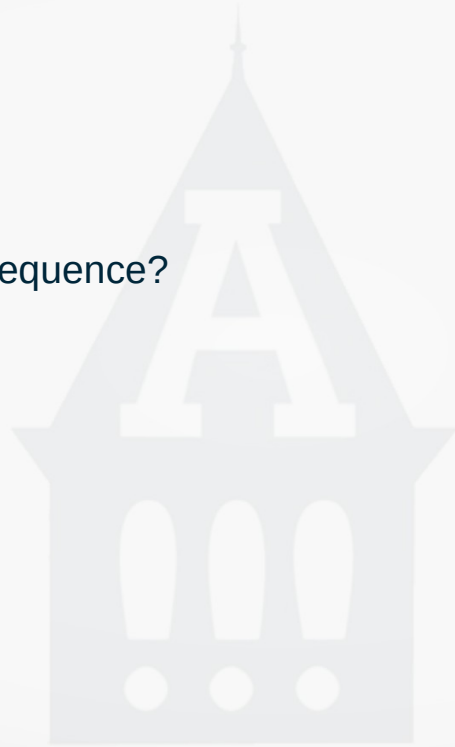
Longest Common Subsequence – Example

- S = ABAZDC
- T = BACBAD
- What is the longest common subsequence?



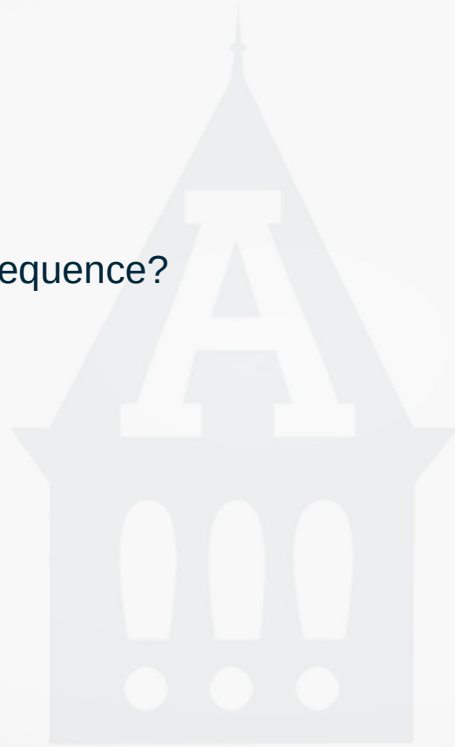
Longest Common Subsequence – Example

- S = ABAZDC
- T = BACBAD
- What is the longest common subsequence?
 - A



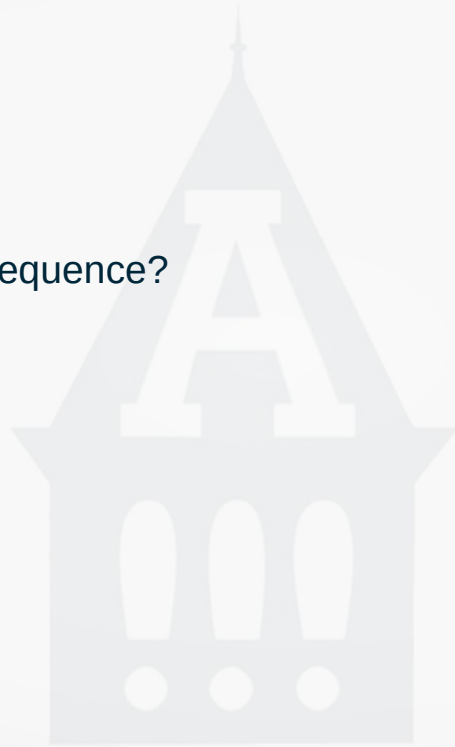
Longest Common Subsequence – Example

- S = **A**BAZDC
- T = B**A**C**B**AD
- What is the longest common subsequence?
 - AB



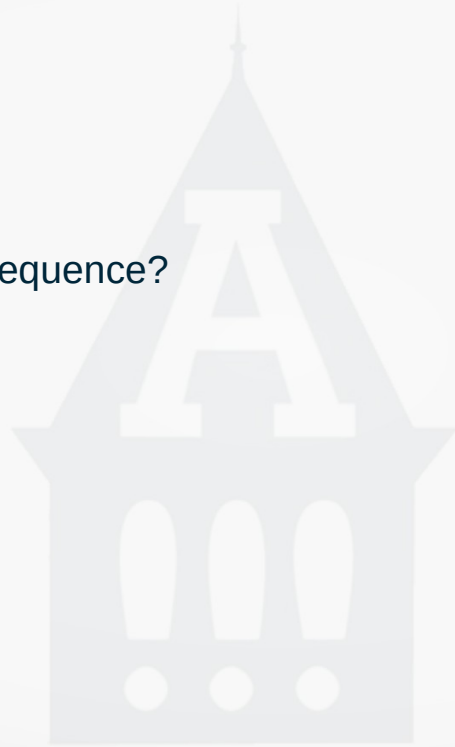
Longest Common Subsequence – Example

- S = **ABA**ZDC
- T = B**ACBA**D
- What is the longest common subsequence?
 - ABA



Longest Common Subsequence – Example

- S = **A**BAZ**D**C
- T = B**A**C**B**A**D**
- What is the longest common subsequence?
 - ABAD



Longest Common Subsequence – Example

- S = **ABA**ZDC
- T = B**AC**BAD
- How can we know we have the LCS?



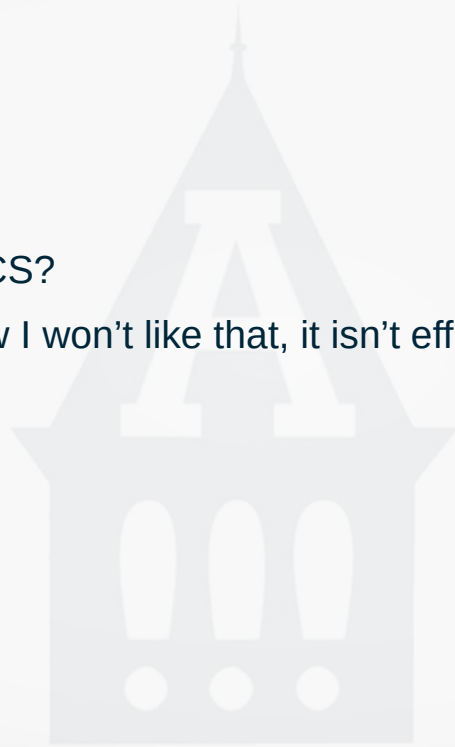
Longest Common Subsequence – Example

- S = **ABA**ZDC
- T = B**AC**BAD
- How can we know we have the LCS?
 - Exhaustive search (you know I won't like that, it isn't efficient)



Longest Common Subsequence – Example

- S = **ABA**ZDC
- T = B**AC**BAD
- How can we know we have the LCS?
 - Exhaustive search (you know I won't like that, it isn't efficient)
 - Dynamic Programming!



Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0						
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, A]
 - no match
 - biggest: 0

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0					
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, G]
 - match: diagonal + 1 = 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1				
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, C]
 - no match
 - biggest: 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1			
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, A]
 - no match
 - biggest: 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1		
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, T]
 - no match
 - biggest: 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [G, G]
 - match: diagonal + 1 = 1
 - Note: comparing G with AGCATG

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0						
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, A]
 - match: diagonal + 1 = 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1					
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, G]
 - no match
 - biggest: 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1				
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, C]
 - no match
 - biggest: 1

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1			
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, A]
 - match: diagonal + 1 = 2

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2		
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, T]2
 - no match
 - biggest: 2

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left
- Cell [A, T]2
 - no match
 - biggest: 2

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0						
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0						
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0						
A	0						

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0						


Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
- An entry in the table is either
 - If the characters match, the diagonal element +1
 - The biggest of the element directly above or to the left

		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence


- Find LCS of GACGTA and AGCATG
 - 3
 - but which three?



		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence


- Find LCS of GACGTA and AGCATG
 - 3
 - but which three?
 - Either end with A, T, G



		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence


- Find LCS of GACGTA and AGCATG
 - 3
 - but which three?
 - Either end with A, T, G
 - If A, then next is G, C



		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence


- Find LCS of GACGTA and AGCATG
 - 3
 - but which three?
 - Either end with A, T, G
 - If A, then next is G, C
 - If G, then next is A



		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence

- Find LCS of GACGTA and AGCATG
 - 3
 - but which three?
 - Either end with A, T, G
 - If A, then next is G, C
 - If G, then next is A
 - AGA



		A	G	C	A	T	G
	0	0	0	0	0	0	0
G	0	0	1	1	1	1	1
A	0	1	1	1	2	2	2
C	0	1	1	2	2	2	2
G	0	1	2	2	2	2	3
T	0	1	2	2	2	3	3
A	0	1	2	2	3	3	3

Longest Common Subsequence

- Is this a hard problem?



Longest Common Subsequence

- Is this a hard problem?
- Can be done in n^2 time; just have to build the table

