

# Global and Local Alignment

# Sequence Alignment Overview

**Input:** Two (or more) sequences over the same alphabet

**Output:** An alignment of the two sequences

ex)

**Input:**

GCGCATTGAGCGA

TGCGTTAGGGTGACCA

**Output:**

- GCGCATTGAGCGA - -

TGCG - - TTAGGGTGACC

# Global Alignment Summary

- Attempts to align every residue in every sequence
- Most useful when sequences you are aligning are similar and of roughly the same size
- Can use the Needleman-Wunsch algorithm to solve this
  - Uses dynamic programming!

# Dynamic Programming

- Brute force alignment impractical because of the many different alignments possible for even small sequences
- Dynamic programming works where a larger problem is solved by first solving smaller sub-problems first
- In the context of global alignment:

$$S[i, j] = MAX \begin{cases} S[i-1, j-1] + \delta(x_i, y_j) \\ S[i-1, j] + \delta(x_i, -) \\ S[i, j-1] + \delta(-, y_j) \end{cases}$$

- We solve for  $S[i, j]$  by first solving subproblems first (this makes more sense once we look at the pseudocode!)

# Needleman-Wunsch Algorithm

## Pseudocode

$M$ -length of sequence 1

$N$ -length of sequence 2

$S$ -dynamic programming matrix of size  
 $M \times N$

$\delta(x_i, -)$ -score from aligning  $x_i$  with a gap

$\delta(-, y_j)$ -score from aligning  $y_j$  with a gap

$\delta(x_i, y_j)$ -score from aligning  $x_i$  with  $y_j$

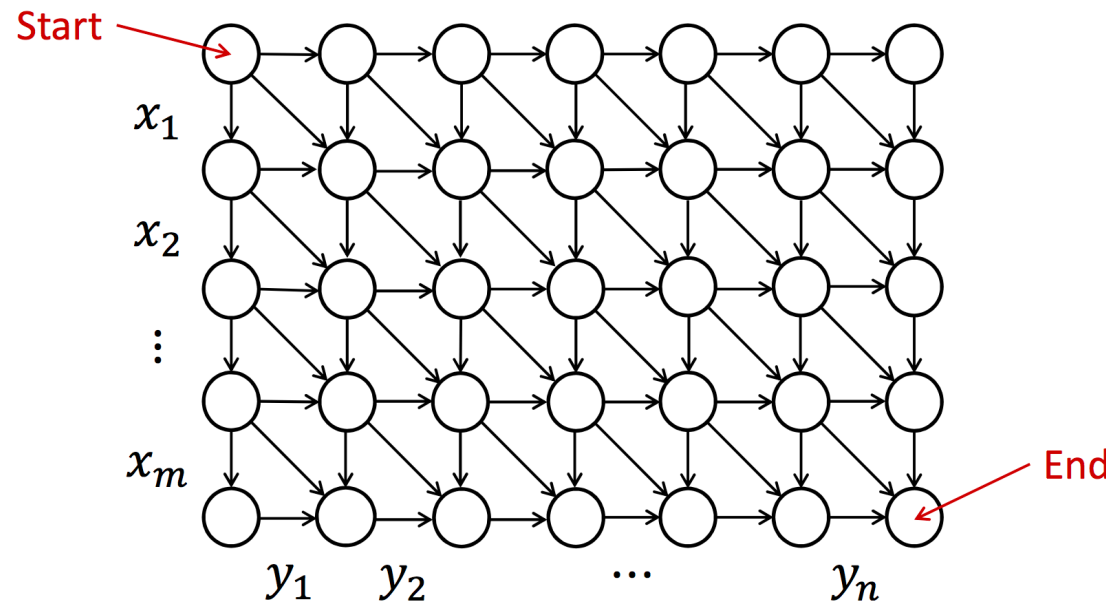
Output: Optimal alignment score for  
aligning  $M$  and  $N$

Time Complexity:  $O(MN)$

```
1   $S[0, 0] = 0$ 
2  for  $i = 1$  to  $M$  do:
3       $S[i, 0] = S[i - 1, 0] + \delta(x_i, -)$ 
4  for  $j = 1$  to  $N$  do:
5       $S[0, j] = S[0, j - 1] + \delta(-, y_j)$ 
6      for  $i = 1$  to  $M$  do:
7           $S[i, j] = \text{MAX} \begin{cases} S[i - 1, j - 1] + \delta(x_i, y_j) \\ S[i - 1, j] + \delta(x_i, -) \\ S[i, j - 1] + \delta(-, y_j) \end{cases}$ 
8  return  $S[M, N]$ 
```

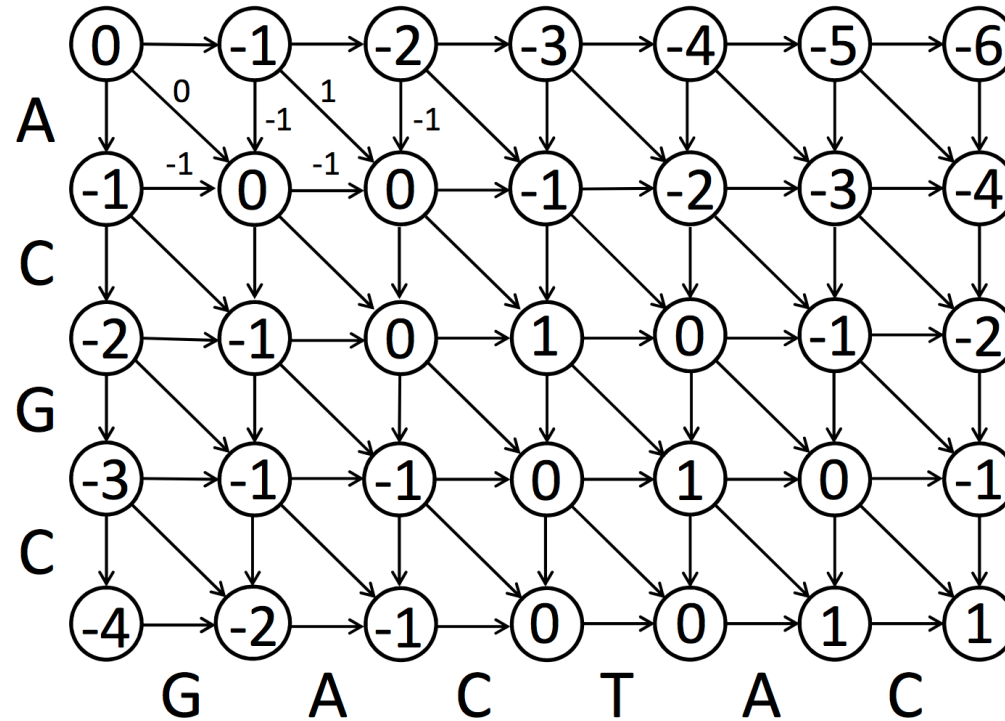
# Needleman-Wunsch Algorithm as an Edit Graph

- We can think of  $S$  (our matrix) as a directed graph that we fill in from the top left corner to the bottom right corner
- Each alignment corresponds to a unique path through the graph



# Example of Runthrough of Algorithm

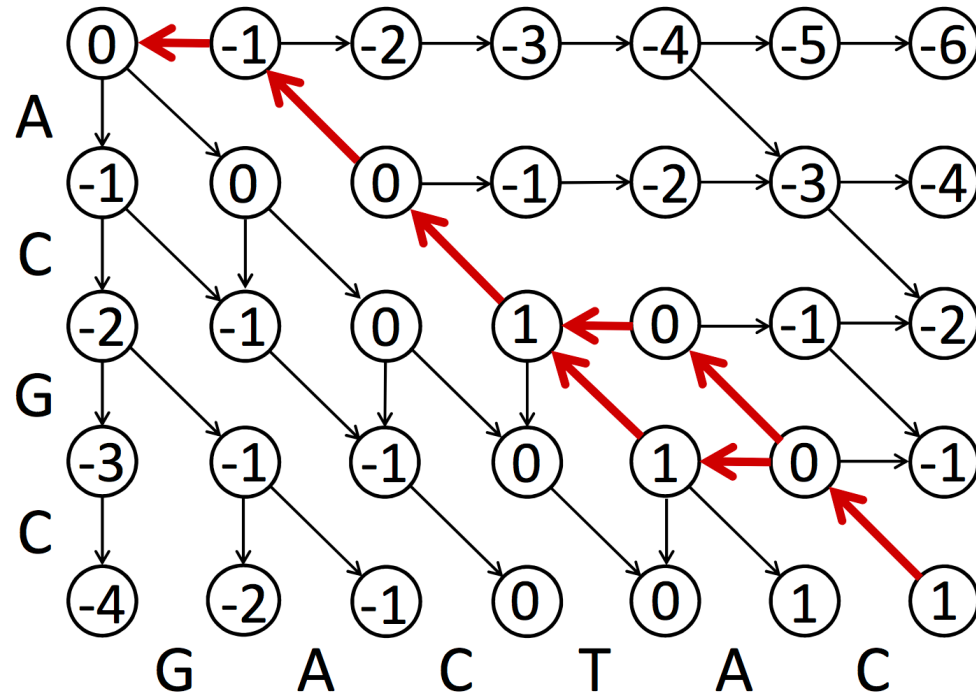
Remember to record which edge(s) led to the score at the given node so we can traceback later



Scores: Match +1 Mismatch 0 Gap -1

# Example of Traceback

Start from the bottom right corner and traceback from there



Optimal alignments:      **-ACG-C**      and      **-AC-GC**  
                                 **GACTAC**                      **GACTAC**



# Local Alignment

- Very similar to global alignment!
- Instead of having to align every single residue, local alignment aligns arbitrary-length segments of the sequences, with no penalty for unaligned sequences
- Biological usefulness: If we have two dissimilar sequences and want to see if there is a conserved gene or region between the two

# Smith Waterman Algorithm

- Use the Smith-Waterman algorithm to calculate local alignment
- Very similar to global alignment
- Only have a change in recurrence relation

$$S_{0,0} = 0$$

$$S_{i,j} = \max \begin{cases} 0 \\ S_{i-1,j-1} + \delta(x_i, y_j) \\ S_{i-1,j} + \delta(x_i, -) \\ S_{i,j-1} + \delta(-, y_i) \end{cases}$$

# Smith Waterman Algorithm Pseudocode

```
1   $S[0, 0] = 0$ 
2  for  $i = 1$  to  $M$  do:
3       $S[i, 0] = 0$ 
4  for  $j = 1$  to  $N$  do:
5       $S[0, j] = 0$ 
6      for  $i = 1$  to  $M$  do:
7           $S[i, j] = \text{MAX} \begin{cases} 0 \\ S[i - 1, j - 1] + \delta(x_i, y_j) \\ S[i - 1, j] + \delta(x_i, -) \\ S[i, j - 1] + \delta(-, y_j) \end{cases}$ 
8  return  $S[M, N]$ 
```

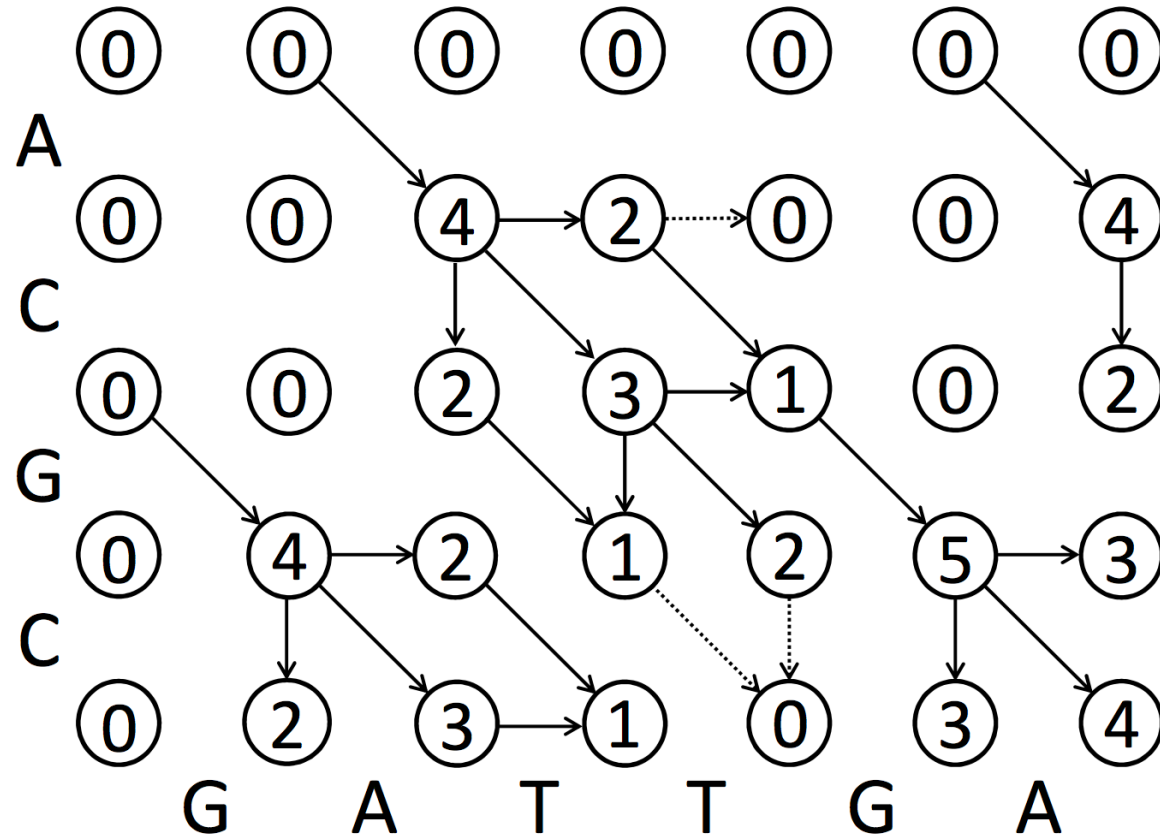
# Local Alignment Runthrough

Two modifications to Needleman-Wunsch:

1) Allow a node to start at 0.

2) Record the highest-scoring node, and trace back from there.

Why does this algorithm yield an optimal local alignment?



Scores: Match +4 Mismatch -1 Gap -2

# Local Alignment Traceback

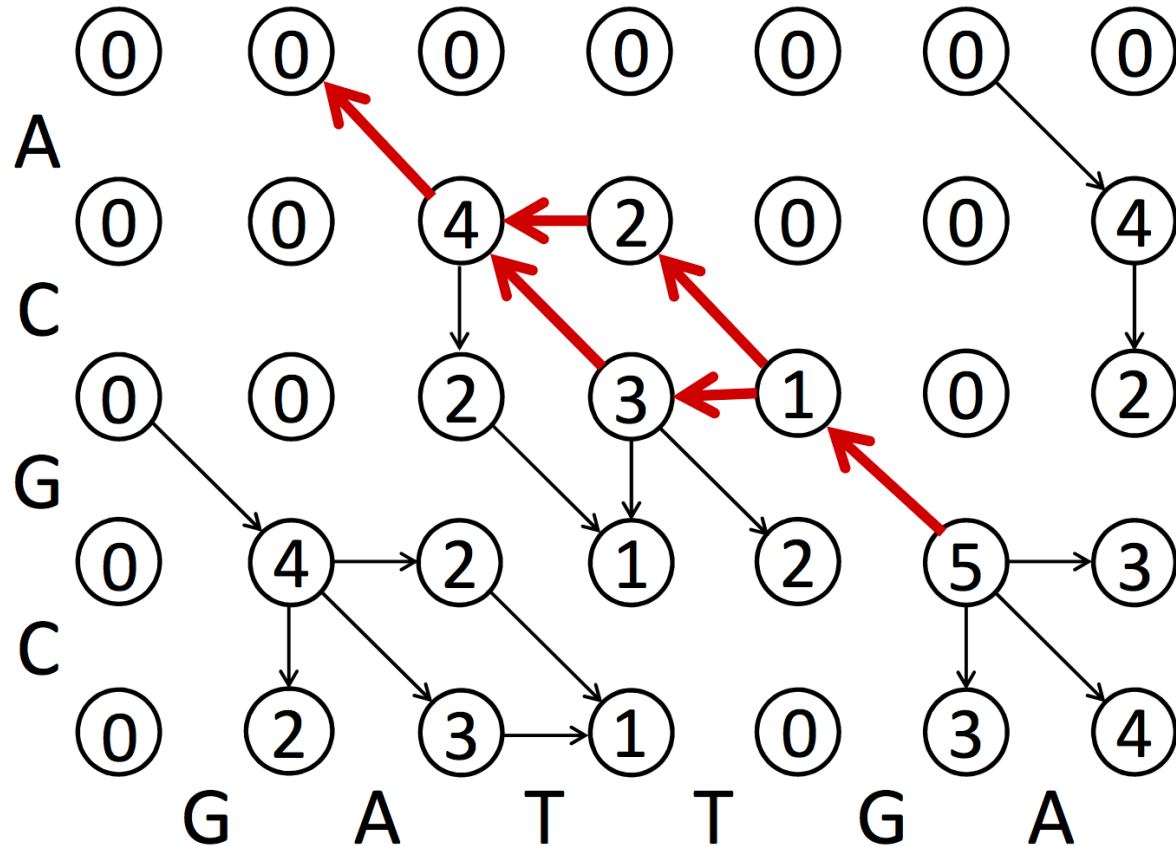
Optimal local alignments,  
or subalignments:

AC-G    and    A-CG  
ATTG    and    ATTG

Questions:

Can one find other  
*locally optimal*  
subalignments?

How can they be  
defined?



Scores: Match +4 Mismatch -1 Gap -2

# Graphics Source

- <https://www.cs.umd.edu/class/fall2011/cmsc858s/Alignment.pdf>