



MARMARA UNIVERSITY
FACULTY of ENGINEERING
COMPUTER ENGINEERING DEPARTMENT

CSE 4065 – Computational Genomics

Programming Assignment # 2

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1 - Implementation Details

In this assignment, we implemented pairwise sequence alignment by using Needleman–Wunsch algorithm.

In our project, we created SequenceAlignment class and inside the class we have alignSequences method that makes the sequence alignment. Method takes the sequences, match score, mismatch score and indel score as arguments. Inside the method, firstly, we created two-dimensional matrix with length of the strings. And then, we filled the first row and first column with the indel score by summing cumulatively. And then, we filled the other cells of the matrix by selecting the highest cumulative score that comes from match/mismatch, insert or delete one by one. Score of each cell is calculated depending on the match, mismatch and indel score given by the user. Finally, the lower right cell of the alignment matrix gives the optimum alignment between the given sequences. Code snippet below shows the implementation of the algorithm inside the project.

```
public int[][] alignSequences(String sequenceOne, String sequenceTwo, int matchScore, int mismatchScore, int indelScore){  
    int[][] alignmentMatrix = new int[sequenceOne.length() + 1][sequenceTwo.length() + 1];  
    alignmentMatrix[0][0] = 0;  
    int matchOrMismatchScore = 0;  
  
    for (int i = 1; i < sequenceOne.length() + 1; i++) {  
        alignmentMatrix[i][0] = alignmentMatrix[i - 1][0] + indelScore;  
    }  
    for (int i = 1; i < sequenceTwo.length() + 1; i++) {  
        alignmentMatrix[0][i] = alignmentMatrix[0][i - 1] + indelScore;  
    }  
  
    for (int i = 1; i < sequenceOne.length() + 1; i++) {  
        for (int j = 1; j < sequenceTwo.length() + 1; j++) {  
            if (sequenceOne.charAt(i - 1) == sequenceTwo.charAt(j - 1)) {  
                matchOrMismatchScore = matchScore;  
            } else {  
                matchOrMismatchScore = mismatchScore;  
            }  
  
            alignmentMatrix[i][j] = Math.max(Math.max(alignmentMatrix[i][j - 1] + indelScore, alignmentMatrix[i - 1][j] + indelScore), alignmentMatrix[i - 1][j - 1] + matchOrMismatchScore);  
        }  
    }  
  
    return alignmentMatrix;  
}
```

Figure 1 - Implementation of Needleman Wunsch Algorithm

After calculation of the sequence matrix, we need to backtrack from sink to source to find the optimum alignment sequence. Inside the SequenceAlignment class, we created backtrackMatrix method that traverse the matrix backward from sink to source by comparing the cell value with three possible sources match/mismatch, insert, delete to see where it comes from. If it is match/mismatch, then nucleotides are aligned. If it is insert, first sequence is aligned with gap. If it is delete, second sequence is aligned with gap. Code below shows the implementation of the backtracking algorithm and its arguments. And then, method prints the aligned sequences on the terminal.

```

public void backtrackMatrix(String sequenceOne, String sequenceTwo, int[][] sequenceMatrix, int indelScore){
    StringBuilder alignmentOne = new StringBuilder();
    StringBuilder alignmentTwo = new StringBuilder();
    int i = sequenceOne.length();
    int j = sequenceTwo.length();

    while (i > 0 || j > 0) {
        if((i > 0) && (j > 0) && (sequenceMatrix[i][j] == sequenceMatrix[i-1][j-1] + matchOrMismatchCheck(sequenceOne.charAt(i-1), sequenceTwo.charAt(j-1)))){
            alignmentOne.insert( offset: 0, sequenceOne.charAt(i-1));
            alignmentTwo.insert( offset: 0, sequenceTwo.charAt(j-1));
            i = i - 1;
            j = j - 1;
        }else if(i > 0 && sequenceMatrix[i][j] == sequenceMatrix[i-1][j] + indelScore ){
            alignmentOne.insert( offset: 0, sequenceOne.charAt(i-1));
            alignmentTwo.insert( offset: 0, str: "-");
            i = i - 1;
        }else{
            alignmentOne.insert( offset: 0, str: "-");
            alignmentTwo.insert( offset: 0, sequenceTwo.charAt(j-1));
            j = j - 1;
        }
    }

    System.out.println(alignmentOne);
    System.out.println(alignmentTwo);
}

```

Figure 2 – Implementation of the Backtracking Algorithm

2 – Program Outputs

Sequence-alignment-result-output.txt file also shared with submitted assignment folder.

Output of test1.seq

```

CGG__GTAGTTAACCTT_ACA_GCATAGAGTCGCGAGATAAAGTGCAGGA_GTCCTTCGCGGCAGATTCGTACCTCAACCAAGTGTACTT_TCTGGCA_TCACGAAT_CTGCCGCATAGGTCCGTGAGT_CCATATGA
AGGAAGTAGTT_AGCCTAACAGGCATAGAGTCGCGACAT_ATGTG_AAGATGTCATT__CGG__TATTCAAACCTCATGCA__T_C_A_TTGCCTTG_AGT__CG_CTCCTGGAAGCATA_GTCCTGTGAGTGCATATGA
Score of the Alignment:
149

```

Output of test2.seq

```

_C_GAGACCGA_C_GAAGAGGTTTGGC_CCCAA_CCAGGTTCC_CTGATCACGTAACCTACCGGCCAAAAGGACTG__GCCTT_ACTAAGGC__CTT__TGCTA_CTGC_G_6__GT_C__CGG_G_6GC_CGTT__GGT_T_TC_GGCAGAACACTTC
CCTG_GACCGAGCTTAA_A__TT_GCTAGCAATACAGATGCCGCT__TC_C_TTGGGGA_GGGTGTGTAGGA_TGTAG_GTTAACGAATGCAAGTTCCGGGGTATC_GCAGAGTCGTGCTACGGCGTGGCAC_TTAGGGTCTCTCGGGAAAAAGAGTAG
Score of the Alignment:
95

```

Output of test3.seq

```

GTGT_GGTTGCTTGATCACTCCGTGTACATGTGACAACCGAAGCTGTGATCCAGCTTTGTTAAGTCAGCTTCGAATG_CGTTAGCTCTCAA_ATATGAT_ATG_AC_TCTTGGGGTAGAT__GCTGG__GGACCTATTGCGC_C_CAAAGCGATAT__TCGGGGCA_CCGGTTTA
G_GTAGGTT_CGTGAAGCACTCC_TGGAC_TCTGACCA_C_AAC_A_TAATCAAGC__G_CAG__AG_TT_GAATGACCAAGCGCTCAAGCT_T__TCACGAACGTC_T__CATATCCGC_GGTCGTA_CAAACGCGCTCTTAAAC_A_ATCGTCTATCCATCCGG__

GGGTACCTATCAAGCGAT_AC_TTCGA_TGCAGTGTGATGCCGG_A_G_GTGTCG_GTCAGCATGTGAGA__GCT
GGATA_CC_A_ATGG_G_TGACATT_AACTG__G_G_CAGGCCGGCACGCG_GACGCGACAG_AT_TGAAATGGAT

Score of the Alignment:
184

```

Output of test4.seq

Sequences do not fit the screen shot but we provide the outputs of the program as sequence-alignment-result-output.txt file inside the submitted folder.

```
CG_GGGAAAGA_CGG__A_ATGCATCG_ACCATCGGACAAT_GC_CTCAC TGGAAGCGCTG__CTGATTTTGC GCA_ACGAGCCTCGGA_CCTCCCG_C_TCAA_CT_TACGAA__A_ATGACTCCACC_____AG_CACTGAA_CCAACTGGCCTCCAG_TGA_AGAT___AGTAT_CT__
AGTGAG_AAGACCGGATATATGCAACGAACAATCGCAAAATAGCTC_CA_TGTACGC_CTGTCCCG_TAATACCGCATGCGAGCCTCGAAGCC_CCGGACGTCAAACCTCAAC_AAGTATAGGGTTCCACC GTATGAGCCACAGAATTC_AGT_TCCTCC_GCTGATAG_TCCCGGT_TCCTCC
Score of the Alignment:
695
```

Output of test5.seq

```
AGGC__CGAAACGTCGCGAAT_T_GACCCTGGCGACCGCCGAACGGGACCTCCGTTAG_TGT_GGGAGGTCATCAATCTCGTTTCGCTAGCGGCTGAC_ACCAATCACTATAAG_TCTGTCATGAC
___CTTC___AA_GT__CAAATATAGATCCTGGC__CG_CTCC___ACGGG_CTTAAG_TCGTTCTCCGAAGGT_A_CGATCTGGTTGGAT_GCTTCCGCTCTA__AA_CA__AGAAGAT_AATC__G__
Score of the Alignment:
82
```