

# Design and Analysis of Algorithms (CS206)

## Assignment - 6

### U19CS012

#### A.) Longest palindrome subsequence problem

##### Problem Statement:

Give an efficient algorithm to find the length of longest palindrome that is a subsequence of a given input string.

A **palindrome** is a nonempty string over some alphabet that reads the same forward and backward. E.g.: civic, racecar, and aibohphobia (fear of palindromes).

A **subsequence** is a sequence that can be derived from another sequence by deleting some elements without changing the order of the remaining elements

If the given sequence is "BBABCBCAB", then the output should be 7 as

"BABCBAB" is the longest palindromic subsequence in it.

"BBBBB" and "BBCBB" are also palindromic subsequences of the given sequence, but not the longest ones.

## (a) Naive iterative solution

```

// (a) Naive iterative solution

bool is_palindrome(string s)
{
    string t = s;
    reverse(t.begin(), t.end());
    return (s == t) ? true : false;
}

int LPS_Iter(string s)
{
    int ans = 1 // minimum LPS is of Length 1
    int n = s.length();

    int lmt = 1 << n; //2^n Possibilities

    for (int i = 0; i < lmt; i++)
    {
        string tmp;
        for (int bit = n - 1; bit >= 0; bit--)
            // If that Bit is Set, add that character
            if (i & (1 << bit))
                tmp += s[bit];

        if (is_palindrome(tmp))
            if (tmp.length() > ans)
                ans = tmp.length();
    }

    return ans;
}
```

Time Complexity:  $O(2^n)$

## (b) Naive recursive solution

```

// (b) Naive recursive solution [Brute Force]
int LPS_NR(string s, int l, int r)
{
    // BASE CASE
    if (l > r)
        return 0;
    // Single Character = Palindrome
    if (l == r)
        return 1;
    // First Character == Last Character
    if (s[l] == s[r])
    {
        // Include the First and Last Character in the Palindrome
        // Recur for Remaining String
        return 2 + LPS_NR(s, l + 1, r - 1);
    }
    else
    {
        // Last character different from First Character
        // 1.) Remove first character & recur for [l+1, r]
        // 2.) Remove last character & recur for [l, r-1]

        // return max of Two Cases
        return max(LPS_NR(s, l + 1, r), LPS_NR(s, l, r - 1));
    }
}
```

Time Complexity:  $O(2^n)$

### (c) Top-down dynamic programming solution [Add Memory Element to Naive Rec.]

---

**Algorithm 1:** Solve function that finds the longest palindromic subsequence

---

**Data:** dp: 2D array that stores the answer to states  
sequence: The sequence to calculate the answer for  
L: The left index of current range  
R: The right index of the current range

**Result:** Returns the longest palindromic subsequence

```
if L > R then
    return 0;
else if L = R then
    return 1;
else if dp[L][R] ≠ -1 then
    return dp[L][R];
else if sequence[L] = sequence[R] then
    dp[L][R] ← 2 + solve(dp, sequence, L + 1, R - 1);
else
    moveL ← solve(dp, sequence, L + 1, R);
    moveR ← solve(dp, sequence, L, R - 1);
    dp[L][R] ← maximum(moveL, moveR);
return dp[L][R];
```

---

Time Complexity:  $O(n^2)$

### (d) Bottom-up dynamic programming solution

---

**Algorithm 2:** Bottom-up approach to find the longest palindromic subsequence

---

**Data:** sequence: The sequence to calculate the answer for  
n: The length of the sequence

**Result:** Returns the length of the longest palindromic subsequence

```
for i ← 1 to n do
    dp[i][0] ← 0;
    dp[i][1] ← 1;
for len ← 2 to n do
    for L ← 1 to n - len + 1 do
        R ← L + len - 1;
        if sequence[L] = sequence[R] then
            dp[L][len] ← 2 + dp[L + 1][len - 2];
        else
            moveL ← dp[L + 1][len - 1];
            moveR ← dp[L][len - 1];
            dp[L][len] ← maximum(moveL, moveR);
return dp[1][n];
```

---

Time Complexity:  $O(n^2)$

## Code:

```
#include <bits/stdc++.h>
// For Time Calculation
#include <chrono>
using namespace std;
using namespace std::chrono;

// (a) Naive iterative solution
bool is_palindrome(string s)
{
    string t = s;
    reverse(t.begin(), t.end());
    return (s == t) ? true : false;
}

int LPS_Iter(string s)
{
    int ans = 1;
    int n = s.length();
    long long int lmt = 1 << n; //2^n Possibilities
    for (int i = 0; i < lmt; i++)
    {
        string tmp;
        for (int bit = n - 1; bit >= 0; bit--)
        {
            // If that Bit is Set
            if (i & (1 << bit))
            {
                tmp += s[bit];
            }
        }
        if (is_palindrome(tmp))
        {
            if (tmp.length() > ans)
                ans = tmp.length();
        }
    }
    return ans;
}

// (b) Naive recursive solution [Brute Force]
int LPS_NR(string s, int l, int r)
{
    // BASE CASE
    if (l > r)
        return 0;
    // Single Character = Palindrome
    if (l == r)
        return 1;
    // First Character == Last Character
```

```

    if (s[l] == s[r])
    {
        // Include the First and Last Character in the Palindrome
        // Recur for Remaining String
        return 2 + LPS_NR(s, l + 1, r - 1);
    }
    else
    {
        // Last character different from First Character
        // 1.) Remove first character & recur for [i+1,j]
        // 2.) Remove Last character & recur for [i,j-1]

        // return max of Two Cases
        return max(LPS_NR(s, l + 1, r), LPS_NR(s, l, r - 1));
    }
}

// (c) Top-down dynamic programming solution
int LPS_TDDP(string s, int l, int r, vector<vector<int>> &mem)
{
    // BASE CASE
    if (l > r)
        return 0;
    // Single Character = Palindrome
    if (l == r)
        return 1;

    // Check if Answer is Already Computed [Memoization]
    if (mem[l][r])
        return mem[l][r];

    // First Character == Last Character
    if (s[l] == s[r])
    {
        // Include the First and Last Character in the Palindrome
        // Recur for Remaining String
        return 2 + LPS_TDDP(s, l + 1, r - 1, mem);
    }
    else
    {
        // Last character different from First Character
        // 1.) Remove first character & recur for [i+1,j]
        // 2.) Remove Last character & recur for [i,j-1]

        // return max of Two Cases
        return max(LPS_TDDP(s, l + 1, r, mem), LPS_TDDP(s, l, r - 1, mem));
    }
}

// (d) Bottom-up dynamic programming solution

```

```

int LPS_BUDP(string s)
{
    int n = s.length();
    // Create a table to store results of subproblems
    int table[n][n];

    int i, j, strlen;

    // String of Length 1 = Palindromic
    for (int i = 0; i < n; i++)
    {
        table[i][i] = 1;
    }

    for (strlen = 2; strlen <= n; strlen++)
    {
        for (i = 0; i < n - strlen + 1; i++)
        {
            j = i + strlen - 1;

            // i -> Left Pointer
            // j -> Right Pointer

            // Same Character Palindrome of Length 2
            if (s[i] == s[j] && strlen == 2)
            {
                table[i][j] = 2;
            }
            else if (s[i] == s[j])
            {
                table[i][j] = 2 + table[i + 1][j - 1];
            }
            else
            {
                table[i][j] = max(table[i + 1][j], table[i][j - 1]);
            }
        }
    }

    // LPS in Range 0 to n-1
    return table[0][n - 1];
}

int main()
{
    string s;
    cin >> s;
    int n = s.length();
    auto start = high_resolution_clock::now();
    auto end = high_resolution_clock::now();

```

```

auto time_taken = duration_cast<nanoseconds>(end - start);
double ans = 0;

// (a) Naive iterative solution
cout << "NAIVE ITERATIVE SOLUTION : " << endl;
start = high_resolution_clock::now();

cout << "Length of Longest Palindromic Subsequence : " << LPS_Iter(s) << endl;

end = high_resolution_clock::now();
time_taken = duration_cast<nanoseconds>(end - start);
ans = (double)time_taken.count() / (double)(1e9);
cout << "Time Taken : " << ans << " seconds." << endl;

// (b) Naive recursive solution
cout << "\nNAIVE RECURSIVE SOLUTION : " << endl;
start = high_resolution_clock::now();

cout << "Length of Longest Palindromic Subsequence : " << LPS_NR(s, 0, n - 1) << endl;

end = high_resolution_clock::now();
time_taken = duration_cast<nanoseconds>(end - start);
ans = (double)time_taken.count() / (double)(1e9);
cout << "Time Taken : " << ans << " seconds." << endl;

// (c) Top-down dynamic programming solution
vector<vector<int>> mem(n, vector<int>(n));
cout << "\nTOP DOWN DP (RECURSIVE + MEMOIZATION) SOLUTION : " << endl;
start = high_resolution_clock::now();

cout << "Length of Longest Palindromic Subsequence : " << LPS_TDDP(s, 0, n - 1, mem) << endl;

end = high_resolution_clock::now();
time_taken = duration_cast<nanoseconds>(end - start);
ans = (double)time_taken.count() / (double)(1e9);
cout << "Time Taken : " << ans << " seconds." << endl;

// (d) Bottom-up dynamic programming solution
cout << "\nBOTTOM UP DP SOLUTION : " << endl;
start = high_resolution_clock::now();

cout << "Length of Longest Palindromic Subsequence : " << LPS_BUDP(s) << endl;

end = high_resolution_clock::now();
time_taken = duration_cast<nanoseconds>(end - start);
ans = (double)time_taken.count() / (double)(1e9);
cout << "Time Taken : " << ans << " seconds." << endl;

return 0;
}

```

### Test Cases:

(A) LEPCABZBQCPBA [Palindrome of Length 7 {PCBZBCP}]

LEPCABZBQCPBA

NAIVE ITERATIVE SOLUTION :

Length of Longest Palindromic Subsequence : 7

Time Taken : 0.016145 seconds.

NAIVE RECURSIVE SOLUTION :

Length of Longest Palindromic Subsequence : 7

Time Taken : 0.001417 seconds.

TOP DOWN DP (RECURSIVE + MEMOIZATION) SOLUTION :

Length of Longest Palindromic Subsequence : 7

Time Taken : 0.000965 seconds.

BOTTOM UP DP SOLUTION :

Length of Longest Palindromic Subsequence : 7

Time Taken : 0 seconds.

(B) GAMXVFLCZQPO [Palindrome of Length 1 {G/A/..Any Character in Str}]

GAMXVFLCZQPO

NAIVE ITERATIVE SOLUTION :

Length of Longest Palindromic Subsequence : 1

Time Taken : 0.008129 seconds.

NAIVE RECURSIVE SOLUTION :

Length of Longest Palindromic Subsequence : 1

Time Taken : 0.001798 seconds.

TOP DOWN DP (RECURSIVE + MEMOIZATION) SOLUTION :

Length of Longest Palindromic Subsequence : 1

Time Taken : 0.001634 seconds.

BOTTOM UP DP SOLUTION :

Length of Longest Palindromic Subsequence : 1

Time Taken : 0.000998 seconds.



The dynamic programming approach is indeed  $O(n^2)$ . However, the recursive solution is exponential in  $n$ : any time two characters don't match, a subproblem of size  $k$  is converted into 2 subproblems of size  $k-1$  each. It's easy to see that, with all letters different, this produces a complexity of  $O(2^n)$ .

$$T(n) = \text{running time on input of length } n$$

$$T(n) = \begin{cases} 1 & n = 1 \\ 2T(n-1) & n > 1 \end{cases}$$

$$= 2^{n-1}$$

```
n = 1: answer = 1, count = 1
n = 2: answer = 1, count = 3
n = 3: answer = 1, count = 7
n = 4: answer = 1, count = 15
n = 5: answer = 1, count = 31
...
n = 24: answer = 1, count = 16777215
n = 25: answer = 1, count = 33554431
n = 26: answer = 1, count = 67108863
```

**Input:**

**ABCDEFGHIJKLMNOPQRSTUVWXYZ**

**2^N COMPLEXITY  
RECURSIVE CALLS**

<https://ideone.com/vrLD4W> [Above Code Implementation Link]

## B.) Edit distance problem

Convert String1 to String2 Using Any Set of 6 Operations:

**Copy** a character from  $x$  to  $z$  by setting  $z[j] = x[i]$  and then incrementing both  $i$  and  $j$ . This operation examines  $x[i]$ .

**Replace** a character from  $x$  by another character  $c$ , by setting  $z[j] = c$ , and then incrementing both  $i$  and  $j$ . This operation examines  $x[i]$ .

**Delete** a character from  $x$  by incrementing  $i$  but leaving  $j$  alone. This operation examines  $x[i]$ .

**Insert** the character  $c$  into  $z$  by setting  $z[j] = c$  and then incrementing  $j$ , but leaving  $i$  alone. This operation examines no characters of  $x$ .

**Twiddle** (i.e., exchange) the next two characters by copying them from  $x$  to  $z$  but in the opposite order; we do so by setting  $z[j] = x[i+1]$  and  $z[j+1] = x[i]$  and then setting  $i = i+2$  and  $j = j+2$ . This operation examines  $x[i]$  and  $x[i+1]$ .

**Kill** the remainder of  $x$  by setting  $i = m+1$ . This operation examines all characters in  $x$  that have not yet been examined. This operation, if performed, must be the final operation.

## (a) Naive iterative solution

### Code:

```
bool check(string s1, string s2, int n, int m, string tmp)
{
    int ptr1 = 0, ptr2 = 0;
    char ch;
    for (int i = 0; i < tmp.length() && ptr1 < n && ptr2 < m; i++)
    {
        ch = tmp[i];
        if (ch == 'C')
        {
            if (s1[ptr1] == s2[ptr2])
            {
                ptr1++;
                ptr2++;
            }
        }
        else if (ch == 'R')
        {
            ptr1++;
            ptr2++;
        }
        else if (ch == 'D')
        {
            ptr1++;
        }
        else if (ch == 'I')
        {
            ptr2++;
        }
        else if (ch == 'T')
        {
            if (ptr1 <= n - 2 && ptr2 <= m - 2)
            {
                if (s1[ptr1] == s2[ptr2 + 1] && s1[ptr2] == s2[ptr1 + 1])
                {
                    ptr1 += 2;
                    ptr2 += 2;
                }
            }
        }
        else
        {
            if (ptr2 == m)
            {
                ptr1 = n;
                break;
            }
        }
    }
}
```

```

        }
        // if (ptr1 == n)
        // {
        //     ptr2 = m;
        //     break;
        // }
    }
}
if (ptr1 == n && ptr2 == m)
    return true;
else
    return false;
}

// Checks all Possible Operations
int Naive(string s1, string s2)
{
    int n = s1.length(), m = s2.length();
    // Since there are 6 Operations
    long int lmt = pow(7, m + n) - 1;
    int res = MAX_VAL;

    // Finding 7-ary Equivalent to Decimal Number

    for (int i = 0; i <= lmt; i++)
    {
        string tmp;
        int nums = i;
        for (int j = 0; j < max(m,n); j++)
        {
            tmp = to_string(nums % 7) + tmp;
            nums /= 7;
        }

        // cout << tmp << "\n";

        bool fl = false;
        for (int k = 0; k < tmp.length(); k++)
        {
            if (tmp[k] == '0')
            {
                fl = true;
                break;
            }
        }

        // Skip Number with 0 -> No Operation
        if (fl != false)
            continue;
    }
}

```

```

string tmp2;
// 1 -> Copy, 2 -> Replace, 3 -> Delete, 4 -> Insert, 5 -> Twiddle 6 -> Kill
for (int k = 0; k < tmp.length(); k++)
{
    if (tmp[k] == '1')
        tmp2 += 'C';
    else if (tmp[k] == '2')
        tmp2 += 'R';
    else if (tmp[k] == '3')
        tmp2 += 'D';
    else if (tmp[k] == '4')
        tmp2 += 'I';
    else if (tmp[k] == '5')
        tmp2 += 'T';
    else
        tmp2 += 'K';
}

```

```

bool is_possible = check(s1, s2, n, m, tmp2);

```

```

if (is_possible)
{
    int cost = 0;
    for (int k = 0; k < tmp2.length(); k++)
    {
        if (tmp2[k] == 'C')
            cost += copy_cost;
        else if (tmp2[k] == 'R')
            cost += rep_cost;
        else if (tmp2[k] == 'I')
            cost += ins_cost;
        else if (tmp2[k] == 'T')
            cost += twiddle_cost;
        else if (tmp2[k] == 'D')
            cost += del_cost;
        else
            cost += kill_cost;
    }
    if (cost < res)
    {
        // cout << tmp2 << endl;
        res = cost;
    }
}
return res;
}

```

Time Complexity =  $O(6^{(m+n)})$

## Test-Case:

```
Enter the Initial String :
not
Enter the Final Required String :
out
Enter the Cost for Following Operations :
COPY : 1
REPLACE : 2
DELETE : 3
INSERT : 4
TWIDDLE : 5
KILL : 6
NAIVE ITERATIVE SOLUTION :
Minimum Cost to Convert not to out : 5
Time Taken : 0.915986 seconds.

NAIVE RECURSIVE SOLUTION :
Minimum Cost to Convert not to out : 5
Time Taken : 0.000995 seconds.

TOP DOWN DP (RECURSIVE + MEMOIZATION) SOLUTION :
Minimum Cost to Convert not to out : 5
Time Taken : 0 seconds.

BOTTOM UP DP SOLUTION :
Minimum Cost to Convert not to out : 5
Time Taken : 0 seconds.
```

## (b) Naive recursive solution

### Code:

```
// (b) Naive recursive solution [Brute Force]
int Edit_Dist_Recur(string s1, string s2, int i, int j)
{
    if (i == -1 && j == -1)
    {
        return 0;
    }

    // If the First String is Empty,
    // Only Option is to Insert all Characters in Second String
    if (i == -1)
    {
        return (j + 1) * ins_cost;
    }

    // If the Second String is Empty,
    // Only Option is to Remove all Characters from First String
    if (j == -1)
    {
        return min(kill_cost, (i + 1) * del_cost);
    }

    int ans = MAX_VAL;

    if (s1[i] == s2[j])
    {
        ans = min(ans, copy_cost + Edit_Dist_Recur(s1, s2, i - 1, j - 1));
    }

    // Twiddle
    if (i >= 1 && j >= 1)
    {
        if (s1[i] == s2[j - 1] && s1[i - 1] == s2[j])
        {
            ans = min(ans, twiddle_cost + Edit_Dist_Recur(s1, s2, i - 2, j - 2));
        }
    }

    ans = min(ans, ins_cost + Edit_Dist_Recur(s1, s2, i, j - 1)); // Insert
    ans = min(ans, del_cost + Edit_Dist_Recur(s1, s2, i - 1, j)); // Remove
    ans = min(ans, rep_cost + Edit_Dist_Recur(s1, s2, i - 1, j - 1)); // Replace

    return ans;
}
```

Time Complexity =  $O(6^{(m+n)})$

## (c) Top-down dynamic programming solution

### Code:

```
// (c) Top-down dynamic programming solution
int Edit_Dist_TD(string s1, string s2, int i, int j, vector<vector<int>> &mem)
{
    if (i < 0 || j < 0)
        return 0;

    // If Sub-Problem has Already been Solved
    if (mem[i][j] != -1)
    {
        return mem[i][j];
    }

    // If any string is empty,
    // return the remaining characters of other string
    if (i == 0)
    {
        mem[i][j] = j * ins_cost;
        return mem[i][j];
    }
    if (j == 0)
    {
        mem[i][j] = min(i * del_cost, kill_cost);
        return mem[i][j];
    }

    int ans = MAX_VAL;

    // If last characters are equal,
    // recur for n-1, m-1
    if (s1[i - 1] == s2[j - 1])
    {
        ans = copy_cost + Edit_Dist_TD(s1, s2, i - 1, j - 1, mem);
    }

    // Twiddle Case
    if (i >= 2 && j >= 2)
    {
        if (s1[i - 1] == s2[j - 2] && s1[i - 2] == s2[j - 1])
        {
            ans = min(ans, twiddle_cost + Edit_Dist_TD(s1, s2, i - 2, j - 2, mem));
        }
    }

    // If characters are not equal, we need to
    // find the minimum cost out of all 3 operations.
    ans = min(ans, ins_cost + Edit_Dist_TD(s1, s2, i, j - 1, mem));    // Insert
```

```

ans = min(ans, del_cost + Edit_Dist_TD(s1, s2, i - 1, j, mem));    // Remove
ans = min(ans, rep_cost + Edit_Dist_TD(s1, s2, i - 1, j - 1, mem)); // Replace

return mem[i][j] = ans;
}

```

Time Complexity =  $O(N^2)$

#### (d) Bottom-up dynamic programming solution

##### Code:

```

// (d) Bottom-up dynamic programming solution
int Edit_Dist_BU(string s1, string s2)
{
    int m = s1.length(), n = s2.length();
    // Table to Store the Results of Sub-Problems
    int dp[m + 1][n + 1];

    // If the Second String is Empty,
    // Only Option is to Remove all Characters from First String
    for (int i = 0; i < m + 1; i++)
    {
        dp[i][0] = min(i * del_cost, kill_cost);
    }

    // If the First String is Empty,
    // Only Option is to Insert all Characters in Second String
    for (int j = 0; j < n + 1; j++)
    {
        dp[0][j] = j * ins_cost;
    }

    // FILL dp[][] in Bottom Up Manner
    for (int i = 1; i <= m; i++)
    {
        for (int j = 1; j <= n; j++)
        {
            dp[i][j] = MAX_VAL;

            // If Last Character is Same,
            // Ignore the Last Character and Recur for Remaining String
            if (s1[i - 1] == s2[j - 1])
                dp[i][j] = dp[i - 1][j - 1] + copy_cost;

            // Twiddle Case
            if (i >= 2 && j >= 2)
            {
                if (s1[i - 1] == s2[j - 2] && s1[i - 2] == s2[j - 1])

```



```

        {
            dp[i][j] = min(dp[i][j], twiddle_cost + dp[i - 2][j - 2]);
        }
    }

    dp[i][j] = min(dp[i][j], ins_cost + dp[i][j - 1]); // Insert
    dp[i][j] = min(dp[i][j], del_cost + dp[i - 1][j]); // Remove
    dp[i][j] = min(dp[i][j], rep_cost + dp[i - 1][j - 1]); // Replace
}
}
return dp[m][n];
}

```

### Test Case:

```

Enter the Initial String :
algorithm
Enter the Final Required String :
altruistic
Enter the Cost for Following Operations :
COPY : 1
REPLACE : 2
DELETE : 3
INSERT : 4
TWIDDLE : 5
KILL : 6

NAIVE RECURSIVE SOLUTION :
Minimum Cost to Convert algorithm to altruistic : 18
Time Taken : 2.17842 seconds.

TOP DOWN DP (RECURSIVE + MEMOIZATION) SOLUTION :
Minimum Cost to Convert algorithm to altruistic : 18
Time Taken : 0 seconds.

BOTTOM UP DP SOLUTION :
Minimum Cost to Convert algorithm to altruistic : 18
Time Taken : 0 seconds.

```

SUBMITTED BY:

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