

# **Algorithms and Data Structures**

Spring 2019

## **Assignment 2**

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Taiyr Begeyev

## Problem 2.1 Merge Sort

(a) Implement a variant of Merge Sort that does not divide the problem all the way down to subproblems of size 1. Instead, when reaching subsequences of length  $k$  it applies Insertion Sort on these  $n/k$  subsequences.

```
/*
    @brief
        Implementation of Insertion Sort Algorithm.
        The array is searched sequentially
        and unsorted items are moved and inserted into the sorted sub-list
    @param array
    @param lenght of the array
*/

void insertionSort(int arr[], int min, int max) {
    int key, j;
    for (int i = min + 1; i <= max; i++) {
        key = arr[i];
        j = i - 1;

        while(j >= min && arr[j] > key) {
            arr[j + 1] = arr[j];
            j--;
        }
        arr[j + 1] = key;
    }
}

/*
    @brief
        Create two arrays(left and right). Find the length of them and
        copy the values from arr to them. Merge them
    @param array
    @param start index
    @param middle index
    @param end index
*/

void merge(int arr[], int start, int middle, int end) {
    int i, j, k;

    //find the length of the Left Hand array
    int lengthOfLeft = middle - start + 1;
    //find the length of the Right Hand array
    int lengthOfRight = end - middle;

    //create two arrays
    int left[lengthOfLeft], right[lengthOfRight];

    //fill two arrays with elements from arr
    for (i = 0; i < lengthOfLeft; i++)
        left[i] = arr[start + i];
    for (j = 0; j < lengthOfRight; j++)
        right[j] = arr[middle + 1 + j];

    i = 0; j = 0; k = start;
    while(i < lengthOfLeft && j < lengthOfRight) {
        if (left[i] <= right[j]) {
            arr[k] = left[i];

```

```

        i++;
    }
    else{
        arr[k] = right[j];
        j++;
    }
    k++;
}

while(i < lengthOfLeft) {
    arr[k] = left[i];
    i++;
    k++;
}

while(j < lengthOfRight) {
    arr[k] = right[j];
    j++;
    k++;
}
}

/*
    @brief
        Sorts the elements in the subarray A[start..end]. If start >= end, the
        subarray has at most one element and is therefore already sorted.
        Otherwise, the divide step simply computes an index middle that
        partitions A[start..end] into two subarrays: A[start..middle] and
        A[middle + 1 .. end]

        To sort the entire sequence, we make initial call, where start = 0
        and end = A.length
    @param array
    @param starting index
    @param ending index
    @param length of a certain subsequence
*/

void mergeSort(int arr[], int start, int end, int k) {
    if (end - start + 1 <= k) {
        insertionSort(arr, start, end);
    }
    else {
        int middle = (end + start) / 2;
        mergeSort(arr, start, middle, k);
        mergeSort(arr, middle + 1, end, k);
        merge(arr, start, middle, end);
    }
}

```

**(b) Apply it to the different sequences from Problem 1.2 (from Homework 1) for different numbers of k. Add the computation times to the plots you had generated in Problem 1.2**

```

/*
    @brief check different arrays for the same k and for different scenarios
    (AVERAGE CASE, WORST CASE, BEST CASE)
    write n size and the corresponding time to output2.dat and output3.dat
    We will check different arrays for two different k

```

```

    @param the name of file we want to write data to
    @param k
    */

    void differentNforTheSameK(string name, int k) {
        ofstream myfile;
        myfile.open(name);

        for (int i = 100; i < 1000; i += 10) {
            int* arr = new int[i]; //main array
            int* arrAverageCase = new int[i];
            int* arrBestCase = new int[i];
            int* arrWorstCase = new int[i];

            randomlyGenerateArray(arr, i);
            copyArray(arr, arrAverageCase, i);
            copyArray(arr, arrBestCase, i);
            copyArray(arr, arrWorstCase, i);

            //WORST CASE
            //start measuring time
            high_resolution_clock::time_point t1 = high_resolution_clock::now();
            mergeSort(arrWorstCase, 0, i - 1, k);
            high_resolution_clock::time_point t2 = high_resolution_clock::now();
            // finish
            //convert to microseconds
            auto duration = duration_cast<microseconds>(t2 - t1).count();
            //write data to the file
            myfile << i << "_" << duration << "_";

            //AVERAGE CASE
            //start measuring time
            t1 = high_resolution_clock::now();
            mergeSort(arrAverageCase, 0, i - 1, k);
            t2 = high_resolution_clock::now();
            // finish
            //convert to microseconds
            duration = duration_cast<microseconds>(t2 - t1).count();
            //write data to the file
            myfile << i << "_" << duration << "_";

            //BEST CASE
            //start measuring time
            t1 = high_resolution_clock::now();
            mergeSort(arrBestCase, 0, i - 1, k);
            t2 = high_resolution_clock::now();
            // finish
            //convert to microseconds
            duration = duration_cast<microseconds>(t2 - t1).count();
            //write data to the file output.dat
            myfile << i << "_" << duration << endl;

            delete [] arr;
            delete [] arrAverageCase;
            delete [] arrWorstCase;
            delete [] arrBestCase;
        }
        myfile.close();
    }
}

```

The full code available in mergeSort.cpp



```

//copy arr to another arrays
copyArray(arr , arrAverageCase , length);
copyArray(arr , arrBestCase , length);
copyArray(arr , arrWorstCase , length);

// Worst Case
// reversed order
reverseOrderOfArray(arrWorstCase , length);

//Best Case
// already sorted array
insertionSort(arrBestCase , 0, length - 1);

cout << "Length_of_the_array:_ " << length << endl;
cout << "Array:_ " << endl;
printArr(arr , length);
cout << endl;

cout << "Sorted_array:_ " << endl;
printArr(arrBestCase , length);
cout << endl;

// -----
// CHECK THE SAME ARRAY FOR DIFFERENT k AND FOR DIFFERENT SCENARIOS
// (AVERAGE CASE, WORST CASE, BEST CASE)
// write k and the corresponding time to output1.dat
for (int k = 1; k <= length; k++) {
    //WORST CASE
    //start measuring time
    high_resolution_clock::time_point t1 = high_resolution_clock::now();
    mergeSort(arrWorstCase , 0, length - 1, k);
    high_resolution_clock::time_point t2 = high_resolution_clock::now();
    // finish
    //convert to microseconds
    auto duration = duration_cast<microseconds>( t2 - t1 ).count();
    //write data to the file output.dat
    myfile1 << k << "_ " << duration << "_ ";

    //AVERAGE CASE
    //start measuring time
    t1 = high_resolution_clock::now();
    mergeSort(arrAverageCase , 0, length - 1, k);
    t2 = high_resolution_clock::now();
    // finish
    //convert to microseconds
    duration = duration_cast<microseconds>( t2 - t1 ).count();
    //write data to the file output.dat
    myfile1 << k << "_ " << duration << "_ ";

    //BEST CASE
    //start measuring time
    t1 = high_resolution_clock::now();
    mergeSort(arrBestCase , 0, length - 1, k);
    t2 = high_resolution_clock::now();
    // finish
    //convert to microseconds
    duration = duration_cast<microseconds>( t2 - t1 ).count();
    //write data to the file output.dat
    myfile1 << k << "_ " << duration << endl;
}

```

```

        //Since we modified our arrays (sorted it), we need to
        get the initial sequence
        // that's why we copy arr to them
        copyArray(arr, arrAverageCase, length);
        copyArray(arr, arrWorstCase, length);
    }

    delete [] arr;
    delete [] arrAverageCase;
    delete [] arrWorstCase;
    delete [] arrBestCase;

    // -----
    // CHECK DIFFERENT ARRAYS FOR THE SAME k AND FOR DIFFERENT SCENARIOS
    // (AVERAGE CASE, WORST CASE, BEST CASE)
    // write n size and the corresponding time to output2.dat and output3.dat

    //We will check different arrays for two different k
    // FIRST
    //k = 20;
    differentNforTheSameK("output2.dat", 20);
    // SECOND
    // k = 50;
    differentNforTheSameK("output3.dat", 50);

    myfile1.close();
    return 0;
}

/*
    @brief
        Implementation of Insertion Sort Algorithm.
        The array is searched sequentially
        and unsorted items are moved and inserted into the sorted sub-list
    @param array
    @param lenght of the array
*/

void insertionSort(int arr[], int min, int max) {
    int key, j;
    for (int i = min + 1; i <= max; i++) {
        key = arr[i];
        j = i - 1;

        while(j >= min && arr[j] > key) {
            arr[j + 1] = arr[j];
            j--;
        }
        arr[j + 1] = key;
    }
}

/*
    @brief
        Create two arrays(left and right). Find the length of them and
        copy the values from arr to them. Merge them
    @param array
    @param start index
    @param middle index
    @param end index

```

```

*/

void merge(int arr[], int start, int middle, int end) {
    int i, j, k;

    //find the length of the Left Hand array
    int lengthOfLeft = middle - start + 1;
    //find the length of the Right Hand array
    int lengthOfRight = end - middle;

    //create two arrays
    int left[lengthOfLeft], right[lengthOfRight];

    //fill two arrays with elements from arr
    for (i = 0; i < lengthOfLeft; i++)
        left[i] = arr[start + i];
    for (j = 0; j < lengthOfRight; j++)
        right[j] = arr[middle + 1 + j];

    i = 0; j = 0; k = start;
    while(i < lengthOfLeft && j < lengthOfRight) {
        if (left[i] <= right[j]) {
            arr[k] = left[i];
            i++;
        }
        else{
            arr[k] = right[j];
            j++;
        }
        k++;
    }

    /* Copy the remaining elements of L[], if there
       are any */
    while(i < lengthOfLeft) {
        arr[k] = left[i];
        i++;
        k++;
    }

    /* Copy the remaining elements of R[], if there
       are any */
    while(j < lengthOfRight) {
        arr[k] = right[j];
        j++;
        k++;
    }
}

/*
  @brief
    Sorts the elements in the subarray A[start..end]. If start >= end, the
    subarray has at most one element and is therefore already sorted.
    Otherwise, the divide step simply computes an index middle that
    partitions A[start..end] into two subarrays: A[start..middle] and
    A[middle + 1 .. end]

    To sort the entire sequence, we make initial call, where start = 0
    and end = A.length

```



```

    @param array
    @param starting index
    @param ending index
    @param length of a certain subsequence
*/

void mergeSort(int arr[], int start, int end, int k) {
    if (end - start + 1 <= k) {
        insertionSort(arr, start, end);
    }
    else {
        int middle = (end + start) / 2;
        mergeSort(arr, start, middle, k);
        mergeSort(arr, middle + 1, end, k);
        merge(arr, start, middle, end);
    }
}

/*
    @brief print an array
    @param array
    @param a length of the array
*/

void printArr(int arr[], int length) {
    for (int i = 0; i < length; i++) {
        cout << arr[i] << " ";
    }
    cout << endl;
}

/*
    @brief generates array of random numbers in a certain range
    @param array and its length
    @returns randomized array
*/

void randomlyGenerateArray(int arr[], int length) {
    for (int i = 0; i < length; i++) {
        arr[i] = rand() % 500 + 1;
    }
}

/*
    @brief copies elements from Arr1 to Arr 2
    @param arr1
    @param arr2
    @param length of both arrays
    @returns the array where elements from arr1 were copied to
*/

void copyArray(int arr1[], int arr2[], int length) {
    for (int i = 0; i < length; i++) {
        arr2[i] = arr1[i];
    }
}

/*
    @brief make a reversed order of an array for the worst case
    @param array and its length

```

```

        @returns reversed array
    */

    void reverseOrderOfArray(int arr[], int length) {
        int positionOfMax, tmp;

        //go through all elements
        for (int i = 0; i < length - 1; i++) {
            //make current element min and remember its position
            positionOfMax = i;
            //find the min in unsorted part
            for (int j = i + 1; j < length; j++) {
                if (arr[j] > arr[positionOfMax]) {
                    positionOfMax = j;
                }
            }

            //swap min with current element if min is not current element
            if (positionOfMax != i) {
                tmp = arr[i];
                arr[i] = arr[positionOfMax];
                arr[positionOfMax] = tmp;
            }
        }
    }

    /*
    @brief CHECK DIFFERENT ARRAYS FOR THE SAME k AND FOR DIFFERENT SCENARIOS
    (AVERAGE CASE, WORST CASE, BEST CASE)
    write n size and the corresponding time to output2.dat and output3.dat
    We will check different arrays for two different k
    @param the name of file we want to write data to
    @param k
    */

    void differentNforTheSameK(string name, int k) {
        ofstream myfile;
        myfile.open(name);

        for (int i = 100; i < 1000; i += 10) {
            int* arr = new int[i]; //main array
            int* arrAverageCase = new int[i];
            int* arrBestCase = new int[i];
            int* arrWorstCase = new int[i];

            randomlyGenerateArray(arr, i);
            copyArray(arr, arrAverageCase, i);
            copyArray(arr, arrBestCase, i);
            copyArray(arr, arrWorstCase, i);

            //WORST CASE
            //start measuring time
            high_resolution_clock::time_point t1 = high_resolution_clock::now();
            mergeSort(arrWorstCase, 0, i - 1, k);
            high_resolution_clock::time_point t2 = high_resolution_clock::now();
            // finish
            //convert to microseconds
            auto duration = duration_cast<microseconds>(t2 - t1).count();
            //write data to the file
            myfile << i << " " << duration << " ";
        }
    }

```

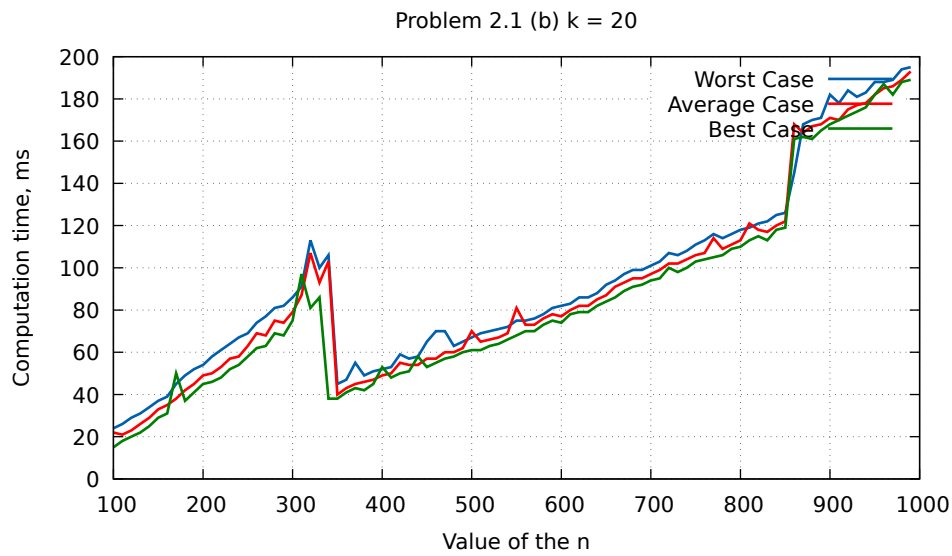
```

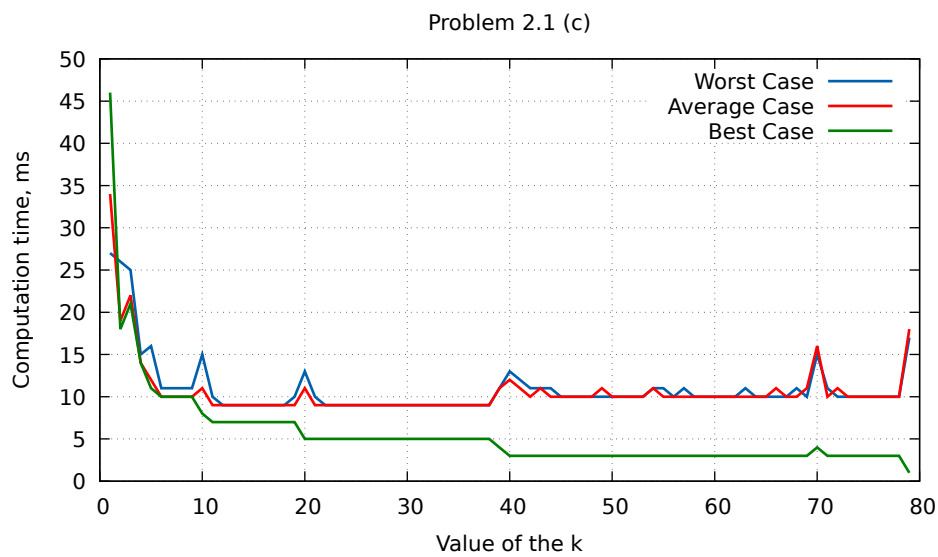
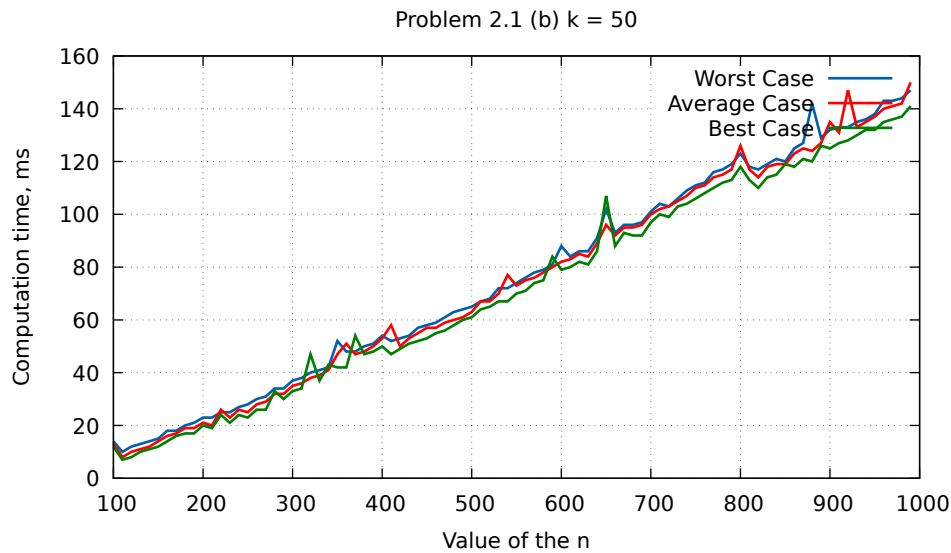
//AVERAGE CASE
//start measuring time
t1 = high_resolution_clock::now();
mergeSort(arrAverageCase, 0, i - 1, k);
t2 = high_resolution_clock::now();
// finish
//convert to microseconds
duration = duration_cast<microseconds>( t2 - t1 ).count();
//write data to the file
myfile << i << " " << duration << " ";

//BEST CASE
//start measuring time
t1 = high_resolution_clock::now();
mergeSort(arrBestCase, 0, i - 1, k);
t2 = high_resolution_clock::now();
// finish
//convert to microseconds
duration = duration_cast<microseconds>( t2 - t1 ).count();
//write data to the file output.dat
myfile << i << " " << duration << endl;

delete [] arr;
delete [] arrAverageCase;
delete [] arrWorstCase;
delete [] arrBestCase;
}
myfile.close();
}

```





### Gnuplot script

```
gnuplot plot1.p
```

```
set terminal pdf
```

```
set output "plot1.pdf"
```

```
# x and y labels
```

```
set xlabel "Value of the k"
```

```
set ylabel "Computation time, ms"
```

```
set title "Problem 2.1 (c)"
```

```
# Line styles
```

```
set style line 1 \
    linecolor rgb "#0060ad" \
    linetype 1 linewidth 2 \
    pointtype 7 pointsize 1.5
```

```
set style line 2 \
    linecolor rgb "#ff0000" \
    linetype 2 linewidth 2 \
    pointtype 7 pointsize 1.5
```

```
set style line 3 \
    linecolor rgb "#008000" \
```

```

linetype 3 linewidth 2 \
pointtype 7 pointsize 1.5

set grid

plot "output1.dat" using 1:2 title "Worst_Case" with lines linestyle 1,\
"output1.dat" using 3:4 title "Average_Case" with lines linestyle 2,\
"output1.dat" using 5:6 title "Best_Case" with lines linestyle 3

set output "plot2.pdf"

set xlabel "Value_of_the_n"
set ylabel "Computation_time,_ms"
set title "Problem_2.1_(b)_k_=20"

plot "output2.dat" using 1:2 title "Worst_Case" with lines linestyle 1,\
"output2.dat" using 3:4 title "Average_Case" with lines linestyle 2,\
"output2.dat" using 5:6 title "Best_Case" with lines linestyle 3

set output "plot3.pdf"

set xlabel "Value_of_the_n"
set ylabel "Computation_time,_ms"
set title "Problem_2.1_(b)_k_=50"

plot "output3.dat" using 1:2 title "Worst_Case" with lines linestyle 1,\
"output3.dat" using 3:4 title "Average_Case" with lines linestyle 2,\
"output3.dat" using 5:6 title "Best_Case" with lines linestyle 3

```

(c) As you can see in the last picture, the best case running time is decreasing when  $k$  is increasing. The Worst Case running time is increasing as  $k$  is increased. The Average case reaches its minimum when  $k$  is around 15. Suppose we have random  $k$ . This means we can just start using the usual merging procedure, except starting it at the level in which each array has size at most  $k$ . This means that the depth of the merge tree is  $\lg(n)\lg(k) = \lg(n/k)$ . Each level of merging is still time  $cn$ , so putting it together, the merging takes time  $\Theta(n\lg(n/k))$

(d) We are dealing with constant factors, so  $k$  should be a value that is the largest in a list, but beats it still gives the result of Insertion Sort beating Merge Sort. In practice,  $k$  should be the largest list length on which insertion sort is faster than merge sort.

## Problem 2.2 Recurrences

Use the substitution method, the recursion tree, or the master method to derive upper and lower bounds for  $T(n)$  in each of the following recurrences. Make the bounds as tight as possible. Assume that  $T(n)$  is constant for  $n \leq 2$ .

(a)  $T(n) = 36T(n/6) + 2n$

1. Extract  $a, b, f(n)$

$$a = 36, b = 6, f(n) = 2n$$

2. Determine  $n^{\log_b a}$

$$n^{\log_b a} = n^{\log_6 36} = n^2$$

3. Compare  $f(n)$  and  $n^{\log_b a}$

Since  $n^2 > 2n$ , then  $n^{\log_b a} > f(n)$

4. Determine the appropriate case and apply it

Thus case 1:

$$f(n) = O(n^{2-\epsilon}) \implies$$

where  $\epsilon = 1$

$$T(n) = \Theta(n^2)$$

**(b)**  $T(n) = 5T(n/3) + 17n^{1.2}$

1. Extract  $a, b, f(n)$

$$a = 5, b = 3, f(n) = 17n^{1.2}$$

2. Determine  $n^{\log_b a}$

$$n^{\log_b a} = n^{\log_3 5}$$

3. Compare  $f(n)$  and  $n^{\log_b a}$

Since  $n^{\log_3 5} > 17n^{1.2}$ , then  $n^{\log_b a} > f(n)$

*Remark:*  $\log_3 5 \approx 1.46$

4. Determine the appropriate case and apply it

Thus case 1:

$$f(n) = O(n^{\log_3 5 - \epsilon}) \implies$$

where  $\epsilon \approx 0.26$

$$T(n) = \Theta(n^{\log_3 5})$$

**(c)**  $T(n) = 12T(n/2) + n^2 \lg n$

1. Extract  $a, b, f(n)$

$$a = 12, b = 2, f(n) = n^2 \lg n$$

2. Determine  $n^{\log_b a}$

$$n^{\log_b a} = n^{\log_2 12} = n^{2 + \log_2 3} = n^2 \cdot n^{\log_2 3}$$

3. Compare  $f(n)$  and  $n^{\log_b a}$

Since  $n^{\log_2 12} > n^2 \lg n$ , then  $n^{\log_b a} > f(n)$

*Remark:*  $\log_2 3 \approx 1.58496$

4. Determine the appropriate case and apply it

Thus case 1:

$$f(n) = O(n^{\log_2 12 - \epsilon}) \implies$$

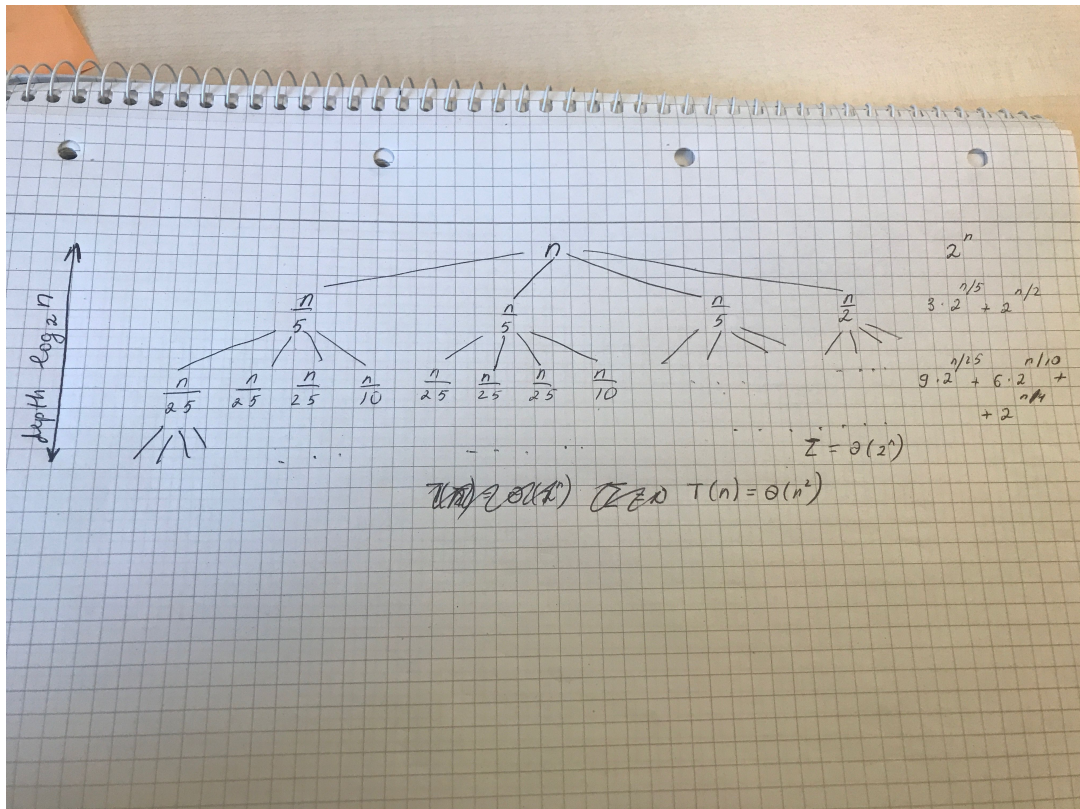
where  $\epsilon \approx 0.58496$

$$T(n) = \Theta(n^{\log_2 12})$$

**(d)**  $T(n) = 3T(n/5) + T(n/2) + 2^n$

Let's solve it by the Recursion Tree Method

$2^n$  dominates the rest of the terms in the finding sum of the tree  $(2^{1/2})^n, (2^{1/5})^n$  Therefore, the result is  $\Theta(2^n)$



(e)  $T(n) = T(2n/5) + T(3n/5) + \Theta(n)$

Let's solve it by the Recursion Tree Method

From Recursion Tree Method, the height of the tree is  $\lg n$ . The sum of nodes at each level equals  $cn$ . It follows that  $T(n) = \Theta(n \lg n)$

