

# Unit 2

## The Divide-and-Conquer Strategy (D&C)

1. **The D&C approach:** Why (reasons)? What (definition and general scheme)? When is it appropriate to use it (“cost cookbook”)?
2. **D&C solutions to Fast-Sorting and Fast-Selection:** **Which are the best D&C solutions to the Sorting problem?** What about the Selection problem?
  - **Lab. 2** Efficiency's empirical analysis of two sorting D&C algorithms
1. **Reduce-and-Conquer Exercises :** Why not D&C exercises?

# Bibliography

- Weiss, M.A. *Data Structures and Problem Solving Using Java, 4th Edition*. Addison-Wesley, 2010. [Chapter 8, sections 5, 6 and 7](#)
- Galiano I. and Prieto N. *Notes from the “Estructuras de Datos y Algoritmos” course*. Previous Computer Science Curriculum. [Available in PoliformaT](#)
  - Apuntes - Diseño recursivo y eficiente: soluciones Divide y Vencerás para la Ordenación y la Selección

# 1. The D&C approach

*Why (reasons)? Recursion: the bad, the good and the fair*



Recursion is a powerful problem-solving approach that yields compact but readable, elegant and very efficient algorithms

**The Sorting Problem:**

Recursion ( $O(x \log x)$ ) VS Iteration ( $O(x^2)$ )

**Divide and Conquer**

**Too much recursion can be dangerous!**

**The Fibonacci numbers:**

Recursion ( $O(2^x)$ ) VS Iteration ( $O(x)$ )



## **MORAL**

Use recursion **ONLY** to solve problems complex enough to deserve it!

# 1. The D&C approach

## *What? Definition*

The D&C Strategy involves three steps at each level of the recursion

- **DIVIDE** the problem of size  $x$  into a number of subproblems  $a$  that are smaller instances of the same problem ( $a > 1$ )

**WARNING:** at least two **DISJOINT** subproblems

**TIPS:** The size of the subproblems **should** reduce the size of the original problem ...

- **GEOMETRICALLY**, or by the same constant factor  $c$ :  $x / c$
- In the most **BALANCED** way possible:  $a = c$
- **CONQUER** the subproblems by solving them recursively, **except**, of course, the base cases
- **COMBINE** the solutions to the subproblems into the solution for the original problem

# 1. The D&C approach

## *What? General scheme and its Recurrence equation*

```
public static ResultType conquer(DataType x) {  
    ResultType method_res, call_1_res, ..., call_a_res;  
    if (x = xbase) { method_res = baseCaseSolution(x); }  
    else {  
        int c = divide(x);  
        call_1_res = conquer(x / c);  
        ...  
        call_a_res = conquer(x / c);  
        method_res = combine(x, call_1_res, ..., call_a_res);  
    }  
    return method_res;  
}
```

**But... Can a Strategy Recurrence Equation be solved? How?**

Recurrence Equation for the general (recursive) case

$$T_{\text{conquer}}(x > x_{\text{base}}) = a * T_{\text{conquer}}(x / c) + \underbrace{T_{\text{divide}}(x) + T_{\text{combine}}(x)}_{\text{Call overhead}}$$

Number of recursive calls      x decreases geometrically

# 1. Divide & Conquer

*When is it appropriate to use it ? “Cost Cookbook”*

**Theorem 1:**  $T_{\text{recursiveMethod}}(x) = a \cdot T_{\text{recursiveMethod}}(x-c) + b, \quad b \geq 1$

- If  $a=1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x)$
- If  $a>1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(a^{x/c})$

**Theorem 2:**  $T_{\text{recursiveMethod}}(x) = a \cdot T_{\text{recursiveMethod}}(x-c) + b \cdot x + d, \quad b \text{ and } d \geq 1$

- If  $a=1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x^2)$
- If  $a>1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(a^{x/c})$

→ **Theorem 3:**  $T_{\text{recursiveMethod}}(x) = a \cdot T_{\text{recursiveMethod}}(x/c) + b, \quad b \geq 1$

- If  $a=1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(\log_c x)$
- If  $a>1$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x^{\log_c a})$

**Reduce & Conquer (Binary Search)**

→ **Theorem 4:**  $T_{\text{recursiveMethod}}(x) = a \cdot T_{\text{recursiveMethod}}(x/c) + b \cdot x + d, \quad b \text{ and } d \geq 1$

- If  $a < c$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x)$
- If  $a = c$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x \cdot \log_c x)$
- If  $a > c$ ,  $T_{\text{recursiveMethod}}(x) \in \Theta(x^{\log_c a})$

**Divide & Conquer (Fast Sorting)**

$$T_{\text{conquer}}(x > x_{\text{base}}) = a * T_{\text{conquer}}(x / c) + T_{\text{divide}}(x) + T_{\text{combine}}(x)$$

# 1. Divide & Conquer

## *How to use the “Cost Cookbook”? Examples*



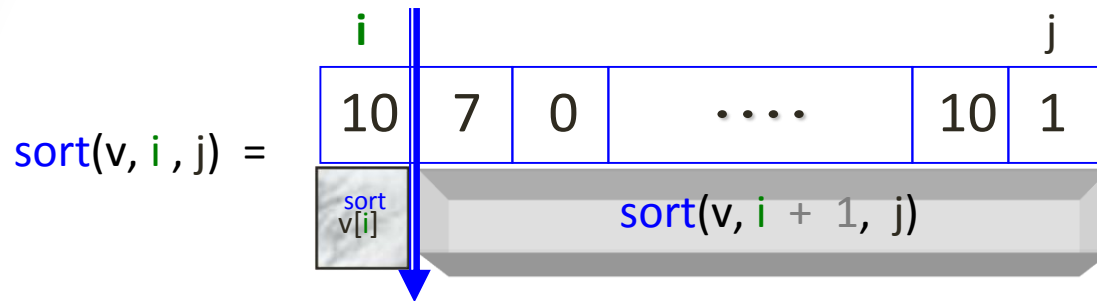
To review what you learned last year about the analysis of recursive methods and, at the same time, to know how to use the “cost cookbook”, the slide-show at left shows some examples

## 2. D&C solutions to Fast-Sorting

### *Two recursive approaches to Sorting*

**Restriction:** sorting **one** element out of the total takes **linear time** in both the worst and the **average** cases

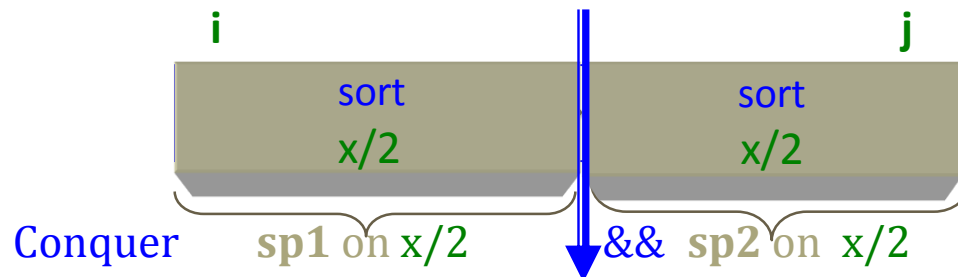
#### “Conservative” approach



Average cost: by **T2 (LinearOverhead)** with  $c = a = 1$ ,  $T_{\text{sort}}^{\mu}(x) \in \Theta(x^2)$

**D&C approach?** **IFF**  $T_{\text{Divide}}(x) + T_{\text{Combine}}(x) = k \cdot x$  && sp1 size  $\approx$  sp2 size ( $c = a$ )

Divide “properly” the original problem of size  $x$  (sort on  $x$ )



Combine “properly” the sp1 & sp2 solutions into the solution to sort on  $x$

Average cost: by **T4 (LinearOverhead)** with  $c = a (= 2)$ ,  $T_{\text{sort}}^{\mu}(x) \in \Theta(x \cdot \log x)$



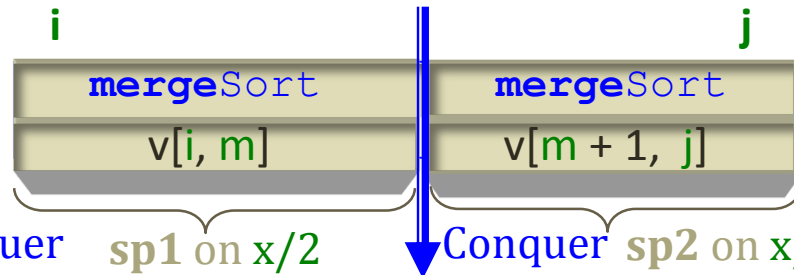
## 2. D&C solutions to Fast-Sorting

*Merge Sort: D&C approach and a-priori cost*

**IFF**  $T_{\text{Divide}}(x) + T_{\text{Combine}}(x) = k \cdot x$  && sp1 size  $\approx$  sp2 size ( $c = a$ )

By **T4 (LinearOverhead)** with  $c = a = 2$ ,  $T_{\text{sort}}^{\mu}(x) \in \Theta(x \cdot \log x)$

Divide “properly” the original problem of size  $x$



$m = (i + j) / 2$ ;  $T_{\text{Divide}}(x) \in \Theta(1)$

Combine “properly” the sp1 & sp2 solutions into the solution for sort on  $x$

$v[i, m] \vee v[m+1, j]$  Sorted

Sort  $v[i, j]$  by **merging** the already sorted  $v[i, m]$  and  $v[m+1, j]$ :  $T_{\text{Combine}}(x) \in \Theta(x)$

```
public static <T extends Comparable<T>> void merge(T[] v, int i, int f, int m) {
    int a = i, b = m + 1, k = 0; T[] aux = (T[]) new Comparable[f - i + 1];
    while (a <= m && b <= f) {
        if (v[a].compareTo(v[b]) < 0) { aux[k++] = v[a++]; }
        else { aux[k++] = v[b++]; }
    }
    while (a <= m) { aux[k++] = v[a++]; }
    while (b <= f) { aux[k++] = v[b++]; }
    for (a = i, k = 0; a <= f; a++, k++) { v[a] = aux[k]; }
}
```

## 2. D&C solutions to Fast-Sorting

### *Merge Sort: D&C approach and a-priori cost*

```
private static <T extends Comparable<T>> void mergeSort(T[] v, int i, int j) {  
    if (i < j) {  
        int m = (i + j) / 2;           // DIVIDE  
        mergeSort(v, i, m);           // CONQUER  
        mergeSort(v, m + 1, j);       // CONQUER  
        merge(v, i, j, m);           // COMBINE  
    }  
}  
  
public static <T extends Comparable<T>> void mergeSort(T v[]) {  
    mergeSort(v, 0, v.length - 1);  
}
```

As expected,  $T_{\text{mergeSort}}(x) \in \Theta(x \cdot \log x)$  by T4:

$$T_{\text{conquer}}(x > 1) = a * T_{\text{conquer}}(x/c) + \underbrace{T_{\text{divide}}(x) + T_{\text{combine}}(x)}_{\Theta(x)}$$

$\downarrow$                        $\downarrow$

$a = 2$                        $c = 2$

## 2. D&C solutions to Fast-Sorting

### *How does Merge Sort works? Unrolling the recursion*



To understand `mergeSort` method, it is worthwhile to consider carefully the dynamics of the method calls. The slide-show at left shows this dynamics “at the click of a mouse” -by tracing the call to its driver method with the array  $v = \{5, 2, 4, 6, 1, 3, 8, 7\}$  as argument